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EXHIBIT 125

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IN THE UNITED STATES DISTRICT COURT

FOR THE NORTHERN DISTRICT OF CALIFORNIA

SAN FRANCISCO DIVISION

VIDEOTAPED DEPOSITION OF YANN LeCUN, Ph.D.

Palo Alto, California

Thursday, November 21, 2024

** HIGHLY CONFIDENTIAL - ATTORNEYS EYES ONLY **

UNDER THE PROTECTIVE ORDER

Stenographically Reported by:

HEATHER J. BAUTISTA, CSR, CRR, RPR, CLR

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1	If you have an understanding of the question	10:27:57
2	independent of that, by means you can provide it.	10:28:00
3	MS. GEMAN: That question was plainly not	10:28:04
4	one that would beget that admonition, so I would	10:28:05
5	respectfully request that you keep your objections	10:28:10
6	to form.	10:28:12
7	MR. WEINSTEIN: I I understand that. I	10:28:12
8	understand you weren't meaning to get that, but the	10:28:13
9	scope of your question is pretty broad and	10:28:15
10	Q. (By Ms. Geman) Do you need to hear the	10:28:18
11	question again?	10:28:19
12	A. No. I think there are two aspects. The	10:28:20
13	first one is a completely practical one which is	10:28:22
14	that those systems are are trained and the	10:28:29
15	answer is different depending on which version of	10:28:32
16	(Stenographer clarification.)	10:28:36
17	THE WITNESS: LLaMA which is the	10:28:37
18	Q. (By Ms. Geman) So I will I can make the	10:28:39
19	question more precise.	10:28:40
20	A. Yes.	10:28:41
21	Q. Do you agree with Meta's decision to fail	10:28:42
22	to disclose the training sources for LLaMA 2, 3, and	10:28:43

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1	4?	10:28:50
2	A. So 4 doesn't exist yet.	10:28:53
3	Q. I understand that.	10:28:55
4	A. So there's two things you can list; right?	10:28:56
5	So you can list the the set of datasets that we	10:29:01
6	used to train the system which was done for LLaMA 1.	10:29:10
7	It was not done for LLaMA 2 and 3.	10:29:13
8	You can also just redistribute the data and	10:29:16
9	that wasn't done for any of the models. For LLaMA	10:29:19
10	1, all those sources were publicly downloadable from	10:29:24
11	the open Internet.	10:29:28
12	For LLaMA 3, that wouldn't be possible	10:29:30
13	because some of the data comes from it's internal	10:29:32
14	data essentially from users of Meta's services, and	10:29:37
15	so it cannot really be distributed, although that	10:29:44
16	content is public. I mean only constituted of	10:29:47
17	public posts and pictures from from users of	10:29:52
18	Meta's platforms. So that would not be distributed.	10:29:57
19	There's also the fact that it's not really	10:30:05
20	useful for that data to be distributed in the first	10:30:09
21	place because the reason for open source	10:30:12
22	(Stenographer clarification.)	10:30:20
21	place because the reason for open source	10:30:12

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1	THE WITNESS: open sourcing a foundation	10:30:22
2	model, such as LLaMA, is is to allow people to	10:30:25
3	use this model without having to train it from	10:30:30
4	scratch which is insanely expensive. So giving the	10:30:32
5	data would not help people particularly.	10:30:41
6	And there's a lot of work that goes into	10:30:45
7	curating a training dataset. Basically filtering it	10:30:52
8	in such a way that it only contains high-quality	10:30:59
9	data, and that is not viewed as something that	10:31:03
10	should be publicly revealed for various reasons.	10:31:09
11	Q. (By Ms. Geman) So my question is: Do you	10:31:13
12	agree in Meta's decision to fail to disclose the	10:31:15
13	training sources for LLaMA 2 and 3?	10:31:18
14	A. So that was a decision by our legal	10:31:21
15	department and I have no input.	10:31:24
16	Q. But you're the chief scientist and a very	10:31:28
17	well-regarded scholar and practitioner of AI, so my	10:31:30
18	question is: Do you agree with that decision?	10:31:36
19	MR. WEINSTEIN: Okay.	10:31:38
20	You can state your personal opinion. Her	10:31:38
21	question isn't asking for it, but don't reveal the	10:31:40
22	communications you had with counsel.	10:31:43

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	plural or not, and so typically a token represents	12:41:44
2	about three-quarter of a word on average.	12:41:47
3	And then there are	12:41:50
4	(Stenographer clarification.)	12:41:55
5	THE WITNESS: agglutinative languages	12:41:55
6	such as German where a word can be constructed by	12:41:57
7	sticking together many words, right, so you have to	12:42:02
8	break that word into individual components. So	12:42:04
9	that's what a token is, really; it's kind of a unit	12:42:08
10	of language that could be smaller than the word.	12:42:12
11	Q. (By Ms. Geman) So let's just say that was	12:42:16
12	the only sentence the LLM trained on it, it would	12:42:17
13	have a set of tokens for that sentence, right	12:42:21
14	A. Yeah.	12:42:23
15	Q "a sheep, a wolf and a cabbage lived on	12:42:24
16	an island."	12:42:28
17	Would if you were to give and every	12:42:29
18	single time it had every single time it trained	12:42:33
19	on that sentence, let's say, it would have that same	12:42:36
20	group of tokens; right? Okay.	12:42:39
21	And if you were to sort of show the LLM	12:42:43
22	that group of tokens, it could spit out that	12:42:47

1	sentence; correct?	Page 130
2	MR. WEINSTEIN: Object to form.	12:42:54
3	THE WITNESS: That's a tricky tricky	
4	answer to that question.	12:43:02
5	Q. (By Ms. Geman) That sentence	12:43:07
6	A. No, I can answer the question, but	12:43:07
7	Q. Okay.	12:43:08
8	A. Okay.	12:43:10
9	Q. Sorry, we're noticing it was an hour and	12:43:12
10	counsel was looking at me, so that's what were	12:43:14
11	noticing.	12:43:15
12	But please please go ahead and then we	12:43:15
13	can do our lunch break.	12:43:17
14	A. Okay.	12:43:19
15	The same way that if I give you a short	12:43:19
16	poem and I keep repeating it to you multiple times,	12:43:22
17	you will learn that poem by by heart. But you're	12:43:28
18	going to be able to regurgitate that poem, if that's	12:43:33
19	the only thing you hear for two days; right?	12:43:36
20	But if the space of those two days you read	12:43:39
21	two novels, you're not going to be able to	12:43:42
22	regurgitate all the words in those novels.	12:43:46

1		Page 131
1	It's exactly the same thing for LLMs. If	12:43:48
2	you train them on a small amount of data and it's a	12:43:50
3	big LLM with a big capacity, memory capacity, and	12:43:54
4	you train it you train it on a small amount of	12:43:56
5	text, it's probably going to be able to regurgitate	12:43:58
6	that, the text you've been training it on, with some	12:44:02
7	degree of fidelity.	12:44:05
8	But if you train it on a lot of data, it	12:44:08
9	just does not have the memory capacity to to	12:44:11
10	store the content and and therefore it's not	12:44:14
11	going to be able to regurgitate any of those texts	12:44:17
12	to any significant extent unless within the training	12:44:21
13	set, a particular short segment of text appears	12:44:26
14	thousands of times.	12:44:30
15	So a famous quote, for example, may appear	12:44:31
16	thousands of times in a training set and the LLM	12:44:35
17	obviously would be able to regurgitate that quote	12:44:38
18	because, you know, it appears so many times and it's	12:44:41
19	probably part of common language if it appears so	12:44:44
20	many times, but it's not going to be able to	12:44:47
21	regurgitate the whole novel or even a chapter or	12:44:50
22	even a paragraph probably.	12:44:53

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1	Q. If a large LLM trained on only one book, it	12:44:55
2	could regurgitate it could regurgitate that book;	12:44:59
3	isn't that true?	12:45:02
4	A. The answer to that question depends on the	12:45:07
5	length of the book and the size of the LLM. So if	12:45:09
6	you train a small language model on a single book,	12:45:13
7	it's not going to be able to regurgitate it.	12:45:16
8	Q. LLaMA could; correct?	12:45:19
9	A. Well, there's sizes of LLaMA. LLaMA 3	12:45:21
10	has	12:45:25
11	(Stenographer clarification.)	12:45:27
12	THE WITNESS: several versions of	12:45:27
13	various sizes. The smallest one is 1 billion	12:45:28
14	parameters. And then there is a 7 billion, 70	12:45:33
15	billion and a 405 billion.	12:45:34
16	Q. (By Ms. Geman) Are you are you	12:45:36
17	disputing that LLaMA 3 could regurgitate a book if	12:45:39
18	that's all it was trained on?	12:45:44
19	A. If it was trained on a single book, not too	12:45:45
20	long, it might be able to store the entire book in	12:45:50
21	its memory and regurgitate it relatively accurately,	12:45:55
22	but nobody would want an LLM of this type. It would	12:46:00

1		Page 133
1	be an extremely inefficient way of storing a book	12:46:03
2	and inaccurate and also expensive.	12:46:08
3	MS. GEMAN: Okay.	12:46:11
4	We can take a break.	12:46:11
5	THE WITNESS: Okay.	12:46:13
6	THE VIDEOGRAPHER: We're going to go off	12:46:14
7	the record. The time is 12:46 p.m.	12:46:15
8	(Lunch recess 12:46 p.m. to 1:42 p.m.)	12:46:26
9	THE VIDEOGRAPHER: We are back on the	12:46:26
10	record. The time is 1:42 p.m.	13:42:19
11	Please proceed.	13:42:21
12	Q. (By Ms. Geman) Hi, Yann. Did you have a	13:42:25
13	good lunch?	13:42:26
14	A. Same as yours, I'm afraid.	13:42:27
15	Q. Okay.	13:42:34
16	I notice you didn't answer if it was a good	13:42:34
17	lunch.	13:42:37
18	What is memorization what is LLM	13:42:37
19	memorization?	13:42:42
20	A. So it's something that does not really	13:42:43
21	exist in the sense that I think as we alluded to	13:42:44
22	earlier, when you train an LLM on a large	13:42:47

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1	I, HEATHER J. BAUTISTA, CSR No. 11600,
2	Certified Shorthand Reporter, certify:
3	That the foregoing proceedings were taken
4	before me at the time and place therein set forth,
	at which time the witness declared under penalty of
5	perjury; that the testimony of the witness and all
	objections made at the time of the examination were
6	recorded stenographically by me and were thereafter
	transcribed under my direction and supervision; that
7	the foregoing is a full, true, and correct
	transcript of my shorthand notes so taken and of the
8	testimony so given;
9	(XX) Reading and signing was not requested/offered.
10	I further certify that I am not financially
11	interested in the action, and I am not a relative or
12	employee of any attorney of the parties, nor of any
13	of the parties.
14	I declare under penalty of perjury under the
15	laws of California that the foregoing is true and
16	correct. Dated: November 26, 2024
17	
18	
19	
20	
21	What to the
22	HEATHER J. BAUTISTA, CSR, CRR, RPR, CLR